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**Abstract:** HIV diversification facilitates immune escape and complicates antiretroviral therapy. In this study, we take advantage of a humanized mouse model to probe the contribution of APOBEC3 mutagenesis to viral evolution. Humanized mice were infected with isogenic HIV molecular clones (HIV-WT, HIV-45G, HIV-ΔSLQ) that differ in their ability to counteract APOBEC3G (A3G). Infected mice remained naïve or were treated with the RT inhibitor lamivudine (3TC). Viremia, emergence of drug resistant variants and quasispecies diversification in the plasma compartment were determined throughout infection. While both HIV-WT and HIV-45G achieved robust infection, over time HIV-45G replication was significantly reduced compared to HIV-WT in the absence of 3TC treatment. In contrast, treatment response differed significantly between HIV-45G and HIV-WT infected mice. Antiretroviral treatment failed in 91% of HIV-45G infected mice while only 36% of HIV-WT infected mice displayed a similar negative outcome. Emergence of 3TC resistant variants and nucleotide diversity were determined by analyzing 155,462 single HIV reverse transcriptase (RT) and 6,985 vif sequences from 33 mice. Prior to treatment, variants with genotypic 3TC resistance (RT-M184I/V) were detected at low levels in over a third of all animals. Upon treatment, the composition of the plasma quasispecies rapidly changed leading to a majority of circulating viral variants encoding RT-184I. Interestingly, increased viral diversity prior to treatment initiation correlated with higher plasma viremia in HIV-45G but not in HIV-WT infected animals. Taken together, HIV variants with suboptimal anti-A3G activity were attenuated in the absence of selection but display a fitness advantage in the presence of antiretroviral treatment. **IMPORTANCE** Both viral (e.g., reverse transcriptase, RT) and host factors (e.g., APOBEC3G (A3G)) can contribute to HIV sequence diversity. This study shows that suboptimal anti-A3G activity shapes viral fitness and drives viral evolution in the plasma compartment of humanized mice.

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# Impact of suboptimal APOBEC3G neutralization on the emergence of HIV drug resistance in humanized mice

Matthew M. Hernandez<sup>1,2\*</sup>, Audrey Fahrny<sup>3\*</sup>, Anitha Jayaprakash<sup>4#</sup>, Gustavo Gers-Huber<sup>3</sup>, Marsha Dillon-White<sup>2</sup>, Annette Audigé<sup>3</sup>, Lubbertus C.F. Mulder<sup>2,5</sup>, Ravi Sachidanandam<sup>4,¶</sup>, Roberto F. Speck<sup>3,¶</sup>, Viviana Simon<sup>2,5,6,¶,\$</sup>

<sup>1</sup> The Graduate School of Biomedical Sciences, Icahn School of Medicine at Mount Sinai, New York, NY, USA

<sup>2</sup> Department of Microbiology, Icahn School of Medicine at Mount Sinai, New York, NY, USA

<sup>3</sup> Division of Infectious Diseases and Hospital Epidemiology, University Hospital of Zurich, University of Zurich, Zurich, Switzerland

<sup>4</sup> Department of Oncological Sciences, Icahn School of Medicine at Mount Sinai, New York, NY, USA

<sup>5</sup> Global Health and Emerging Pathogens Institute, Icahn School of Medicine at Mount Sinai, New York, NY, USA

<sup>6</sup> Division of Infectious Diseases, Department of Medicine, Icahn School of Medicine at Mount Sinai, New York, NY, USA

\* M.M.H. and A.F. contributed equally to this work. The order of the first authors was determined on the basis of seniority.

¶ R.S. ([ravi.sachidanandam@mssm.edu](mailto:ravi.sachidanandam@mssm.edu)), R.F.S. ([roberto.speck@usz.ch](mailto:roberto.speck@usz.ch)) and V.S. are co-senior authors of this study.

Current affiliations/address:

# Girihlet, Inc. 355 30th Street, Oakland, CA-94609; [www.girihlet.com](http://www.girihlet.com)

30 Corresponding author (\$):  
31 Dr. Viviana Simon  
32 Department of Microbiology  
33 Icahn School of Medicine at Mount Sinai  
34 Email: [viviana.simon@mssm.edu](mailto:viviana.simon@mssm.edu)  
35  
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37

38 **ABSTRACT**

39 HIV diversification facilitates immune escape and complicates antiretroviral  
40 therapy. In this study, we take advantage of a humanized mouse model to probe the  
41 contribution of APOBEC3 mutagenesis to viral evolution. Humanized mice were infected  
42 with isogenic HIV molecular clones (HIV-WT, HIV-45G, HIV- $\Delta$ SLQ) that differ in their  
43 ability to counteract APOBEC3G (A3G). Infected mice remained naïve or were treated  
44 with the RT inhibitor lamivudine (3TC). Viremia, emergence of drug resistant variants and  
45 quasispecies diversification in the plasma compartment were determined throughout  
46 infection. While both HIV-WT and HIV-45G achieved robust infection, over time HIV-45G  
47 replication was significantly reduced compared to HIV-WT in the absence of 3TC  
48 treatment. In contrast, treatment response differed significantly between HIV-45G and  
49 HIV-WT infected mice. Antiretroviral treatment failed in 91% of HIV-45G infected mice  
50 while only 36% of HIV-WT infected mice displayed a similar negative outcome.  
51 Emergence of 3TC resistant variants and nucleotide diversity were determined by  
52 analyzing 155,462 single HIV reverse transcriptase (*RT*) and 6,985 *vif* sequences from 33  
53 mice. Prior to treatment, variants with genotypic 3TC resistance (RT-M184I/V) were  
54 detected at low levels in over a third of all animals. Upon treatment, the composition of the  
55 plasma quasispecies rapidly changed leading to a majority of circulating viral variants  
56 encoding RT-184I. Interestingly, increased viral diversity prior to treatment initiation  
57 correlated with higher plasma viremia in HIV-45G but not in HIV-WT infected animals.  
58 Taken together, HIV variants with suboptimal anti-A3G activity were attenuated in the  
59 absence of selection but display a fitness advantage in the presence of antiretroviral  
60 treatment.

61

62 **IMPORTANCE**

63 Both viral (e.g., reverse transcriptase, *RT*) and host factors (e.g., APOBEC3G  
64 (A3G)) can contribute to HIV sequence diversity. This study shows that suboptimal anti-  
65 A3G activity shapes viral fitness and drives viral evolution in the plasma compartment of  
66 humanized mice.

67

## 68 INTRODUCTION

69 HIV diversity is extensive on both an individual level and a global level. It drives  
70 viral adaptation in distinct cellular environments and facilitates escape from immune  
71 surveillance and antiretroviral therapy (ART,(1)). A combination of HIV features including  
72 high *in vivo* mutation rate, high replication rate and recombination between co-packaged  
73 genomes contributes to viral diversification (2, 3). Although the high mutation rate is  
74 caused by the error-prone nature of the HIV reverse transcriptase (*RT*, (4, 5)), the  
75 mutagenesis by host apolipoprotein B mRNA editing enzyme, catalytic polypeptide-like 3  
76 (APOBEC3) cytidine deaminases also contributes to diversity (6-8). If left unchecked by  
77 HIV Vif, several of the APOBEC3 family members limit HIV replication, by mutating the  
78 viral cDNA during reverse transcription introducing guanosine to adenosine (G-to-A) (9-  
79 13). Counteraction of APOBEC3G (A3G), APOBEC3F (A3F) and the stable haplotypes of  
80 APOBEC3H (A3H) by HIV Vif is essential for establishing a robust infection *in vivo*  
81 (reviewed in (10, 14)). However, proviruses in HIV infected patients frequently display high  
82 numbers of G-to-A mutations in dinucleotide contexts suggesting previous suboptimal  
83 anti-APOBEC3 activity (15-17). In fact, HIV Vif alleles obtained from the plasma and/or  
84 peripheral blood cell compartment of patients differ – to some extent – in their ability to  
85 counteract the different APOBEC3 proteins (18-20).

86 Our understanding of the impact of HIV Vif variation on HIV/AIDS disease  
87 outcomes remains incomplete since such studies in patients are inherently limited in  
88 scope and descriptive in nature (11, 21, 22). With the advent of the humanized mouse  
89 model in the past decade, *in vivo* studies investigating HIV pathogenesis (23-25), novel  
90 therapeutic interventions (26-29) and viral evolution (30-32) under controlled experimental  
91 conditions have become possible. Experiments in different humanized mice systems (e.g.,  
92 NOG, NSG, BLT) established that HIV Vif is necessary for infection (33, 34). Moreover,  
93 the impact of A3F, A3G and A3H on replication has been tested using HIV Vif mutant  
94 viruses that are defective in counteracting A3D, A3F, A3G or A3H (35-37). These studies  
95 show that the failure to neutralize A3G results in severe attenuation of viral replication with  
96 viruses unable to counteract A3G being less diverse than their wild-type counterparts (35,  
97 36). Thus, interrogation of A3G-driven HIV diversification in an “all or nothing” fashion  
98 indicates that a complete loss of anti-A3G activity results in HIV restriction and limits viral  
99 diversification.

100           However, most circulating HIV strains maintain some activity against A3G such  
101   that experiments with viruses with suboptimal anti-A3G activity may provide a more  
102   relevant picture regarding the effects of partial APOBEC3 neutralization. Moreover, we  
103   reasoned that to directly test to what extent variation in APOBEC3 neutralization capacity  
104   influences HIV evolution *in vivo*, one needs to perturbate not only the HIV Vif-A3G axis  
105   (e.g., by using HIV Vif mutants) but also the viral equilibrium reached upon establishment  
106   of infection (e.g., by administering an antiretroviral to apply selection pressure). Thus, in  
107   this study, we infected humanized mice with wild type and selected Vif mutant viruses and  
108   monitored infection in the plasma compartment over time in the presence and absence of  
109   antiretroviral treatment in the form of 3TC monotherapy. We assessed viral replication by  
110   longitudinally quantifying plasma viremia as well as viral diversification using a high-  
111   resolution, molecular ID tag based deep sequencing approach. Our data indicate that  
112   suboptimal neutralization of A3G results in attenuated viral replication in the absence of  
113   selection but provides a replication advantage in the presence of 3TC antiretroviral  
114   treatment.

115

## 116 MATERIALS AND METHODS

### 117 Ethics statement

118 Animal experiments were approved by the Cantonal Veterinary Office (#26/2011 &  
119 #93/2014) and performed in accordance to local guidelines and to the Swiss animal  
120 protection law. The Ethical Committee of the University of Zurich approved the  
121 procurement of human cord blood and written informed consent was provided prior to the  
122 collection of cord blood.

### 123 Cell-lines

124 HEK293T cells were obtained from ATCC (CRL-3216) and TZM-bl reporter cells were  
125 obtained from the AIDS Research and Reference Reagent Program, Division of AIDS,  
126 NIAID, National Institutes of Health (NIH AIDS Reagent Program, cat. 8129) (38-42). HEK  
127 293T cells and TZM-bl reporter cells were maintained in Dulbecco's modified Eagle  
128 medium (DMEM, Fisher Scientific, cat. MT10-013-CV) supplemented with 10% fetal  
129 bovine serum (FBS) (Gemini Bio-Products) and 100 U/mL penicillin-streptomycin (Fisher  
130 Scientific, cat. MT30002CI). HEK 293T and TZM-bl cells were grown on 100mm Falcon™  
131 Standard Tissue Culture Dishes (Fisher Scientific, cat. 08-772E).

### 132 Generation of viral stocks

133 Isogenic molecular clones were derived from pNL4-3 (HIV-WT; NIH AIDS Reagent  
134 Program, cat. 114) (43), Replication competent molecular clones encoding Vif mutants  
135 E45G (HIV-45G) and SLQ144AAA (HIV-ΔSLQ) were generated as previously described  
136 (44). Viral stocks were generated by transfecting HEK293T cells using 4μg/mL  
137 polyethylenimine (PEI, Polysciences Inc., cat. 23966). Culture supernatants were  
138 collected 48 hours post-transfection, filtered and frozen at -80°C until further use. Viral  
139 stock concentrations were quantitated using an in-house p24 ELISA (45) and/or tittered on  
140 TZM-bl reporter cells as previously described (44).

### 141 Generation of humanized mice

142 Animals were housed under specific pathogen free conditions. Humanized mice were  
143 generated as previously described (29). Briefly, newborn immunodeficient NOD-scid IL-  
144 2Rγ-null (NSG) mice (Jackson laboratory, Bar Harbor, ME) were irradiated 1-3 days after  
145 birth with 1 Gy and transplanted intrahepatically with approximately  $2.0 \pm 0.5 \times 10^5$  cord



146 blood-derived CD34+ cells. Between 2 and 6 mice were transplanted with cells from the  
147 same donor. A total of 12 donors were used for the three infection experiments.  
148 Twelve to sixteen weeks after transplantation, human engraftment and *de novo* human  
149 immune system reconstitution in the mice were assessed by staining peripheral blood with  
150 monoclonal antibodies against the panhuman marker CD45 (Beckman Coulter, cat.  
151 B36294), CD19 (Biolegend, cat. 302212), CD3 (Biolegend, cat. 300308), CD4 (Biolegend,  
152 cat. 300518) and CD8 (Biolegend, cat. 301035). Flow-cytometry analyses were performed  
153 on a CyAN™ ADP Analyzer (Beckman Coulter, Brea, CA).

#### 154 **A3H genotyping**

155 We determined the A3H genotype as described previously (46) for the twelve cord-blood  
156 donors whose CD34+ cells were used for the reconstitution of the mice. Briefly, genomic  
157 DNA was extracted from the CD34 negative flow-through fraction of the cord blood using  
158 DNeasy DNA isolation kit (QIAGEN, cat. 69504). The regions surrounding the A3H codon  
159 15 and the A3H codon 105 were amplified using Taq polymerase (QIAGEN, cat. 201203).  
160 The column-purified PCR products were sequenced and manually aligned using DNASTar  
161 (SeqMan, DNASTAR, Madison, WI).

#### 162 **Infection and antiretroviral treatment of humanized mice**

163 Mice were infected intraperitoneally with  $2 \times 10^5$  TCID<sub>50</sub> per mouse of each of the 3 HIV  
164 clones in 200μL volume. Plasma viremia was measured using Cobas® Amplicor  
165 technology (Roche, Switzerland) at the described time points throughout the infection. The  
166 detection limit of the assay is 400 HIV RNA copies/mL.

167 Lamivudine (3TC Eпивir, GlaxoSmithKlein, UK) treatment was started 30 days post  
168 infection in the treatment group of the infected mice. 3TC tablets were weighed,  
169 pulverized and combined with food pellets as previously described (29).

#### 170 **Amplification of HIV from plasma viral RNA**

171 Viral RNA was extracted from 140μL frozen plasma using the QIAamp Viral RNA Minikit  
172 (QIAGEN, cat. 52904) as per manufacturer's instruction.

173 For deep sequencing, cDNAs were synthesized using custom reverse transcription  
174 primers.(Supplemental Table 1; Integrated DNA Technologies). From 5' to 3', our first  
175 generation *RT* cDNA primer (4372) included a 16 basepair (bp) HIV-specific sequence

176 (accession: AF324493.2: 3336-3351), 8 bp randomized sequence (unique molecular ID  
177 (UMID)) and an additional 23 bp HIV-specific sequence (AF324493.2: 3305-3327). Viral  
178 cDNA was synthesized using the Invitrogen™ ThermoScript RT-PCR System (Thermo  
179 Fisher Scientific, cat. 11146016). Briefly, RNA and primer were denatured at 65°C for 5  
180 min. ThermoScript reaction mix was added to the RNA and primer and incubated at 50°C  
181 for 60 min, followed by an inactivation step of 85°C for 5 min.

182 Viral cDNA was column purified (Zymo Clean and Concentrator kit, cat. D4034) and  
183 amplified in a first round PCR using primers 1922 (AF324493.2: 2929-2946) and 1923  
184 (AF324493.2: 3337-3356). For the first round PCR used Pfx50 polymerase (94°C for 2  
185 min, followed by 23 cycles of 93°C for 15 sec, 48°C for 30 sec, 68°C for 60 sec and a final  
186 extension of 68°C for 10 min) (Thermo Fisher Scientific, cat. 12355012). First round  
187 products were purified (Zymo Clean and Concentrator) and a second PCR was performed  
188 to add Illumina-based adapters using custom primers 1690 and one of 73 primers with  
189 distinct MiSeq barcode identifiers (Supplemental Table 1). The second round PCR used  
190 PfuUltra II Fusion HS Polymerase (95°C for 2 min, followed by 25 cycles of 93°C for 20  
191 sec, 50°C for 20 sec, 72°C for 15 sec and a final extension of 72°C for 10 min) (Agilent  
192 Technologies, cat. 600672). Second round PCR products were confirmed by  
193 electrophoresis and purified by SPRIselect magnetic bead selection (Beckman Coulter,  
194 cat. B23317).

195 To amplify *vif* sequences from plasma vRNA, a *vif* specific cDNA synthesis primer was  
196 used (4373). From 5' to 3', primer 4373 included a 16 bp T7 sequence, an 8 bp  
197 randomized sequence and 23 bp HIV-specific sequence (AF324493.2: 5386-5406). Viral  
198 cDNA was synthesized using the ThermoScript RT-PCR System and purified as  
199 described above. cDNAs were amplified in the first round PCR using primers 2402  
200 (AF324493.2: 4993-5012) and 2401 (T7). First round products were purified and amplified  
201 in a second round PCR using primers 2403 and one of 80 primers with distinct MiSeq  
202 barcode identifiers and complementarity to the T7 sequence. PCR cycling conditions were  
203 the same as used for the *RT* products.

#### 204 **MiSeq Library Preparation and MiSeq Instrumentation**

205 Sequencing libraries were run on the Illumina MiSeq and sequenced as paired-end reads.  
206 To prepare libraries, bead-purified PCR products containing Illumina adapters (376 bp *RT*

207 amplicons and 393 bp *vif* amplicons) were quantitated by Qubit dsDNA HS Assay Kit  
208 (Thermo Fisher Scientific, cat. Q32854). To sequence 250 bp of the RT region, a 6pM  
209 final library was run with a 20% spike-in of PhiX Control V3 (Illumina, cat. FC-110-3001)  
210 for 2x150 cycles using MiSeq Reagent Kit v2 (300 cycles, Illumina, cat. MS-102-2002) or  
211 MiSeq Reagent Kit v3 (600 cycles, Illumina, cat. MS-102-3003). Custom sequencing  
212 primers were used for the forward (1692), index (3890), and reverse (3889) reads. To  
213 sequence a 269 basepair long region of *vif*, a 6pM final library was run with a 15% spike-  
214 in of PhiX Control V3 for 2x150 cycles. Custom sequencing primers were used for the  
215 forward (4580), index (4577) and reverse (4578) reads (Supplemental Table 1).

## 216 **Bioinformatic Pipeline for Sequence Analyses**

217 Custom Unix and Perl scripts were written to process FASTQ files. First, paired-end reads  
218 were merged using Paired-End reAd mergeR (47). Reads were aligned to pNL4-3 *RT* or  
219 *vif* reference sequences (AF324493.2) and filtered. Sequences were grouped by distinct  
220 UMIDs. A minimum of three high quality merged pair-end reads contained the same UMID  
221 were required to generate a consensus sequence. Consensus sequences were defined  
222 as sequences where each nucleotide reflected 70% or more of all nucleotides sequenced  
223 for that given position. Consensus sequences for sequences defined by a distinct UMID  
224 were identified using in-house scripts. Twenty-five UMIDs that differed by only one  
225 mismatch from the HIV template sequence were considered to be experimental artifacts  
226 and excluded from the analyses.

227 Additional custom scripts were written to identify 3TC resistance mutations at *RT* codon  
228 184 and to compute overall mutation rates, GG-to-GA as well as GA-to-AA mutagenesis  
229 and the frequency of stop codons within the sequenced *RT* and *vif* regions. DNASP v5  
230 polymorphism software was used to calculate the nucleotide diversity ( $\pi$ ), defined as the  
231 average pair-wise number of nucleotide differences per site in all possible pairs of  
232 consensus sequences per sample (48).

## 233 **Statistics**

234 Normality was assessed using the D'Agostino and Pearson test for numerical data such  
235 as baseline plasma viremia, changes in viremia, proportions of 3TC susceptible/resistant  
236 viral sequences, nucleotide diversity, and mutation rates. If groups passed normality tests,  
237 parametric student's t-test for unpaired data or paired student's t-test for paired data were

238 used. Otherwise, non-parametric Mann-Whitney or Wilcoxon matched pairs signed-rank  
239 tests were used. For categorical data (e.g., treatment failure/success), Fisher's exact test  
240 was used. Linear regression models were used for replication kinetics and F-tests were  
241 used to compare slopes of curves of best fit. Finally, nonlinear regression methods  
242 (exponential (Malthusian)) using weighted least squares were used with extra sum-of-  
243 squares F-test to compare nonlinear curves of best fit.

244 Significance testing is reported as exact p-values in the text or using asterisks (\*,  $p \leq 0.05$ ;  
245 \*\*,  $p \leq 0.01$ ; \*\*\*,  $p \leq 0.001$ ; \*\*\*\*,  $p \leq 0.0001$ ). All statistics were performed using the built-in  
246 analysis packages from GraphPad Prism v8.0 Suite (GraphPad Software, Inc, La Jolla,  
247 CA).

#### 248 **Data availability**

249 All raw FASTQ sequencing files have been made publicly available at the NCBI Short  
250 Read Archive (bioproject PRJNA579142, sample accessions SAMN13103784-  
251 SAMN13103916). In addition, all in-house scripts for sequence read processing and data  
252 analyses can be accessed at <https://github.com/SimonLab1850/Vif-pipeline>.

253

## 254 RESULTS

### 255 HIV-WT and HIV-45G establish productive infection in the humanized mouse model 256 system.

257 We performed three independent long-term infection experiments in 48 humanized  
258 NSG (hu-NSG) mice mimicking natural infection (Exp. 1; 85 days follow-up post infection)  
259 or treatment interventions (Exp. 2 and Exp. 3; 58-75 days of follow up post infection). **Fig.**  
260 **1A** depicts the time line for each experiment including the viruses used for infection and  
261 the time points at which blood samples were collected for further analysis (e.g., plasma  
262 viremia, HIV RNA sequence analysis).

263 The three viruses selected for these experiments (HIV-WT, HIV-45G and HIV-  
264  $\Delta$ SLQ) consist of isogenic clones of the HIV NL4-3 isolate that differ in their ability to  
265 counteract A3G. These mutants have been well characterized previously by us and others  
266 (12, 18, 44). Briefly, NL4-3 serves as HIV-WT. NL4-3 Vif counteracts A3G, A3F and A3D  
267 but is inactive against the stable A3H haplotypes (46). HIV- $\Delta$ SLQ fails to bind Cullin5 E3  
268 ligase complex due to three alanines in place of the SLQ BC-box motif (144-146) and,  
269 therefore, fails to counteract any of the APOBEC3 proteins. HIV-45G carries a single point  
270 mutation in codon 45 of Vif (HIV-45G) (18, 44, 49). This mutation in Vif results in  
271 attenuation but not complete abrogation of its activity against A3G while preserving  
272 activity against A3F and A3D (18). Importantly, residue 45 of Vif has not been associated  
273 with other Vif functions and is not involved in any other viral gene products (50, 51). HIV-  
274 WT and HIV-45G replicate to comparable levels in primary human peripheral  
275 mononuclear cells while HIV- $\Delta$ SLQ fails to initiate a spreading infection in cell culture (44).  
276 Importantly, suboptimal neutralization of A3G by HIV-45G does not result in a sizeable  
277 replication defect in short-term cell culture infection experiments making it very well suited  
278 for *in vivo* infection experiments aimed at studying evolution in humanized mice.

279 Hu-NSG mice were reconstituted with CD34+ cells isolated from umbilical cord  
280 blood and immune reconstitution was confirmed after 90 days prior to infection. A total of  
281 twelve different cord blood donors were used across the three independent infection  
282 experiments. Since HIV NL4-3 fails to counteract the active A3H haplotypes (46), we  
283 determined the A3H genotypes of all cord blood donors. None of the donors harbored two  
284 alleles of the active, stable A3H haplotypes. Five donors had one stable A3H haplotype  
285 and seven had two alleles of the unstable A3H haplotypes.

286 In all three experiments, we measured viremia at Day 30 post infection. Infection  
287 with HIV-WT and HIV-45G established comparable average viremia with no significant  
288 difference between the three independent infection experiments (**Fig. 1B**). In good  
289 agreement with previous findings, a functional HIV Vif was necessary to establish a  
290 productive infection since all four hu-NSG mice infected with HIV- $\Delta$ SLQ displayed no  
291 detectable plasma viremia at Day 30 post infection (**Fig. 1B**). As anticipated, the presence  
292 of a single active A3H allele did not differentially influence the baseline viral load observed  
293 with the isogenic HIV-WT or HIV-45G viruses as tested by post-hoc multiple comparisons  
294 tests (Dunn's) ( $p \geq 0.1084$ ).

295

#### 296 **Replication of HIV-45G but not HIV-WT is attenuated over time in humanized mice**

297 In the natural infection experiment (Exp. 1), we followed viral replication in the  
298 plasma compartment for nearly three months post infection. Plasma viremia was  
299 measured using molecular diagnostics at regular intervals. All productively infected  
300 animals (HIV-WT, N=14; HIV-45G, N=8) maintained viremia above the limit of detection  
301 until the end of the experiment. HIV- $\Delta$ SLQ infected animals never displayed viral load  
302 measurements above 400 copies/ml (limit of detection of the assay). The change in  
303 plasma viremia over time is plotted in **Fig. 2A**. While HIV-WT infection resulted in an  
304 increase of replication over time in all but two animals, HIV-45G replication was  
305 attenuated in the majority of infected animals within 40-60 days post infection. The change  
306 in plasma viremia between baseline (i.e., Day 30 post infection) and endpoint was  
307 significantly different between the two viruses (HIV-45G: 0.77  $\log_{10}$  decrease versus HIV-  
308 WT 0.43  $\log_{10}$  increase;  $p=0.0026$ ). Taken together, *in-vivo* HIV-45G replication appears  
309 to be attenuated, although this trait becomes apparent only 50-60 days post infection.

310

#### 311 **Suboptimal neutralization of A3G confers superior viral fitness in the presence of** 312 **3TC in the humanized mouse model system.**

313 In the treatment intervention infection experiments (Exp. 2 and Exp. 3), animals  
314 robustly infected with either HIV-WT (N=11) or HIV-45G (N=11) were treated with 3TC  
315 starting at Day 30 post infection until the end of infection (e.g., Day 75 in Exp. 2 and Day

316 58 in Exp. 3). Of note, the blood collection intervals in Exp. 3 were shorter than in  
317 Experiment 2 (4-7 day versus 14 day intervals).

318 The initial virological response upon 3TC initiation was comparable between the  
319 two groups. Within the first two weeks of 3TC treatment both HIV-WT and HIV-45G  
320 viremia decreased to comparable nadirs ( $0.69 \log_{10}$  versus  $0.66 \log_{10}$ , respectively) (**Fig.**  
321 **2C**). One mouse (#120, infected with HIV-45G) was euthanized at Day 44 post infection  
322 as per animal safety protocol due to signs of wasting. Considering the overall change from  
323 baseline to experiment termination, HIV-WT replication *decreased* by  $0.55 \log_{10}$  in the  
324 presence of 3TC, whereas HIV-45G viremia had *increased* by  $0.25 \log_{10}$  from baseline  
325 ( $p=0.0045$ ) (**Fig. 2D**). Moreover, HIV-45G infected animals experienced a larger ( $0.99$   
326  $\log_{10}$  vs.  $0.52 \log_{10}$ ,  $p=0.0068$ , **Fig. 2E**) and faster ( $0.061$  vs.  $0.033 \log_{10}/\text{day}$ ,  $p=0.0052$ ,  
327 **Fig. 2F**) viral rebound from the initial lowest points reached upon 3TC treatment initiation.

328 We also assessed 3TC treatment outcomes in a qualitative manner (e.g.,  
329 treatment success versus failure, with success being defined as sustained reduction in  
330 viremia with less than  $0.5 \log_{10}$  rebound from the lowest points). Antiviral treatment was  
331 successful in 64% of HIV-WT infected mice but only 9% of HIV-45G infected mice (**Fig.**  
332 **2G**). Thus, HIV-45G infected mice had a significantly higher risk of failing treatment (RR:  
333 7.000; 95% CI 1.482 – 40.54;  $p=0.0237$ ).

334 Taken together, the replication of HIV-45G in the absence (Exp. 1) and in the  
335 presence of 3TC (Exp. 2 and Exp. 3) was very different (compare Figs. **2B** and **2D**). While  
336 the fitness of HIV-45G was attenuated over time in naïve animals, its replication was  
337 significantly less affected by 3TC than that of HIV WT suggesting the existence of a  
338 selection advantage.

339

#### 340 Dynamics of genotypic 3TC drug resistance

341 The molecular mechanisms resulting in 3TC resistance are well described (52-58).  
342 Single point mutations in codon 184 of HIV *RT* emerge rapidly upon 3TC treatment both *in*  
343 *vivo* and in cell culture. RT-184I (ATG->ATA) and RT-184V (ATG->GTG) are the most  
344 common substitutions observed in HIV infected patients failing 3TC-containing ART (59)  
345 (**Fig. 3A**). These substitutions confer up to >1,000-fold reduced susceptibility to 3TC (53,  
346 58). Both mutations can result from reverse transcription errors, although the mutation



347 leading to RT-184I is also within a dinucleotide context favored for A3G driven  
348 mutagenesis (e.g., GG-to-AG mutations, (ATGG->ATAG))(55, 60).

349 To further investigate the *in-vivo* dynamics of resistance appearance, we used a  
350 next generation sequencing approach to analyze a 250 bp region of HIV *RT* (codon 177 to  
351 258) from cell-free HIV RNA (vRNA) present in the plasma compartment. We combined a  
352 unique molecular ID (UMID) strategy, to compensate for PCR-mediated amplification bias  
353 and errors (61, 62), with 150 bp paired-end Illumina sequencing chemistry. Briefly, two  
354 series of custom primers with an 8 bp randomized IDs were used to tag HIV vRNA during  
355 the reverse transcription step prior to amplification and sequencing. We sequenced a total  
356 of 111 vRNA samples obtained from 34 animals (primer #4372: 69 vRNA, 14 mice; primer  
357 #4633: 42 vRNA, 20 mice) generating a total of 9,705,468 high-quality paired-end reads  
358 representing 155,462 UMIDs (=individual HIV genomes). On average, we obtained 1,400  
359 UMIDs for each individual plasma sample generating between 1,333 and 17,854 unique  
360 *RT* consensus sequences for each infected animal over the course of the infection.

361 This approach, importantly, provides sufficient resolution to identify minority viral  
362 populations and provide insights into the composition of the viral quasispecies. We first  
363 analyzed the mutations present at codon 184 of *RT* (Figs. **3B-3D**). Minority 3TC resistant  
364 populations (defined as 1% or more of the overall number of UMIDs present in a given  
365 sample) were detectable after Day 30 post infection but prior to 3TC treatment in a third of  
366 the HIV-WT (N=4) and HIV-45G (N=5) infected mice ("pre-existing 3TC drug resistance"  
367 **Fig. 3B**). RT-184I resistant viruses were far more common than RT-184V (HIV-WT,  
368  $p=0.0342$ ; HIV-45G,  $p=0.0273$ ) but generally made up less than 10% of the sampled  
369 circulating viruses in a given animal. A combination of RT-184V and RT-184I was found  
370 in two animals (identified by the specific mouse number in **Fig. 3B**). Of note, when we  
371 stratified by treatment outcome, pre-existing 3TC drug resistance was not associated with  
372 treatment failure ( $p=0.5227$ , Fisher's exact test) and did not display any significant  
373 relationship with rate of nadir formation (HIV-WT,  $p=0.0762$ ; HIV-45G,  $p=0.1115$ ) or  
374 rebound rate (HIV-WT,  $p=0.3267$ ; HIV-45G,  $p=0.0849$ ).

375 We next examined the dynamics of 3TC drug resistance in treated mice (**Figs. 3C-**  
376 **3D**). In most animals, the 3TC-susceptible RT-184M majority was rapidly replaced with  
377 viruses encoding 3TC-resistant RT-184I or RT-184V alleles. On rare occasions,  
378 substitutions other than Valine or Isoleucine were detected at codon 184 (e.g., ACG (T),



379 AAG (K)). The kinetics of RT-184I and RT-184V appearance in the plasma compartment  
380 were comparable in HIV-WT infected mice ( $p=0.2107$ , **Fig. 3C**) but RT-184I variants  
381 emerged 8.7 times more rapidly than RT-184V in HIV-45G infected mice ( $p=0.0035$ , **Fig.**  
382 **3D**). Overall, the relative proportion of the HIV-45G variants with RT-184V remained  
383 stable or declined over time while HIV-45G variants with RT-184I steadily increased (**Fig.**  
384 **3D**). Thus, emergence of viral variants with RT-184I is favored over that of RT-184V  
385 variants in animals infected with a virus displaying suboptimal A3G neutralization activity.  
386 Of note, M184I variants also appear often prior to M184V variants in 3TC treated patients  
387 (53, 58).

388

### 389 **Characterization of RT sequence diversity throughout the course of infection**

390 We next determined sequence diversity within the sequenced RT region beyond  
391 the 3TC drug resistance associated codon 184. We calculated the nucleotide diversity ( $\pi$ )  
392 among unique RT variants within a given plasma sample (63-65).

393 Prior to 3TC treatment (Day 30 post infection), mice infected with HIV-WT and  
394 HIV-45G showed comparable nucleotide diversity in RT ( $p=0.6308$ , **Fig. 4A**). However,  
395 when we assessed the relationship between RT nucleotide diversity and the plasma viral  
396 load measured at Day 30 (prior to treatment initiation), we noted that nucleotide diversity  
397 positively correlated with the level of plasma viremia in HIV-45G infected animals (**Fig.**  
398 **4C**) while the opposite was true for HIV-WT infected animals (**Fig. 4B**). For this analysis  
399 we assumed an exponential (Malthusian) relationship based on the nature of HIV growth  
400 and diversity in acute infection (66, 67).

401 We next explored how RT sequence diversity changed throughout the course of  
402 infection. While RT diversity remained largely unchanged in treatment-naïve animals, both  
403 HIV-WT and HIV-45G diversity in treated animals initially increased but then stabilized  
404 (Day 44 post infection, **Fig. 4D-E**). RT sequence diversity in 3TC treated mice was driven  
405 by drug resistance associated mutations. Indeed, mutations at RT codon 184 contributed  
406 to 49-74% of HIV-WT and 45-69% of HIV-45G diversity (data not shown). When we  
407 excluded codon 184 from  $\pi$  analyses, any increases in diversity from baseline to Day 44  
408 through Day 75 were lost in the HIV-WT infected mice ( $p\geq 0.3097$ ). However, when we did  
409 the same for HIV-45G infected mice, HIV-45G viruses displayed a significant increase in

410 diversity starting at Day 58 through Day 75 post infection ( $p \leq 0.0430$ , Mann-Whitney).  
411 Thus, while the observed increase in RT sequence diversity is mainly due to selection of  
412 3TC resistant variants, other sites within RT contribute to viral diversity in HIV-45G  
413 infected mice. However, these non-drug resistance associated changes in HIV-45G  
414 viruses are only observed at later time points suggesting that they require more time to  
415 appear.

416 Next, we explored the contribution of APOBEC3-driven mutagenesis to the RT  
417 sequence diversity. Towards this end, we measured G-to-A mutations within APOBEC3-  
418 specific dinucleotide motifs (e.g., A3G: GG-to-AG; A3D/A3F: GA-to-AA, (68)). The 250 bp  
419 long region of RT that we sequenced contains 15 GG and 25 GA dinucleotides that could  
420 serve as APOBEC3 target motifs. At Day 30 post infection (prior to 3TC treatment), both  
421 HIV-WT and HIV-45G viruses carried more GG-to-AG than GA-to-AA mutations but the  
422 differences were only significant for the HIV-45G infected animals ( $p = 0.0020$ , **Fig. 5A**). At  
423 Day 58 post infection in treated mice (**Fig. 5C**), GG-to-AG rates were higher than GA-to-  
424 AA rates in both HIV-WT ( $p = 0.0078$ ) and HIV-45G ( $p = 0.0020$ ) infected mice. GG-to-AG  
425 mutation rates in HIV-WT and HIV-45G mice were comparable ( $p = 0.6965$ ) and were not  
426 due to selection of the RT-184I as rates were still comparable after analyses of sequences  
427 with codon 184 excluded ( $p = 0.3445$ , Mann-Whitney).

428 Due to its preferred dinucleotide context, A3G-induced mutagenesis can introduce  
429 mutations resulting in premature stop codons (e.g., UGG-to-UAG, (7, 69, 70)). Given that  
430 premature stop codons within RT are deleterious to replication (71-76), we were surprised  
431 to see that most infected animals (10/14 HIV-WT, 11/12 HIV-45G) had, at least, one  
432 plasma viral genome with mutations resulting in a stop codon upon protein translation.  
433 HIV-WT and HIV-45G viral populations in the plasma displayed stop codons  
434 predominantly at the four tryptophan (UGG-to-UAG or -UGA) codons (e.g., W212, W229,  
435 W239, W252) and rarely, at one of the six glutamine encoding codons (CAG-to-UAG,  
436 CAA-to-UAA; Q182, Q197, Q207, Q222, Q242, Q258). Of the 155,462 unique RT  
437 analyzed, 868 carried mutations leading to premature stop codon. The majority of the RT  
438 sequences (85%) only had a single stop codon but a small portion of sequences had two  
439 (11%), three (3%) or, at most, four (1%) stop codons. The rate of stop codons at Day 30  
440 and at Day 58 post infection was, however, comparable between the two groups  
441 ( $p = 0.1294$ , **Fig. 5B**;  $p = 0.1211$ , **Fig. 5D**).

442 **Characterization of *vif* sequence diversity throughout the course of infection**

443       Lastly, we were interested in the extent to which the *vif* sequences changed over  
444 the course of infection. We used samples remaining from a subset of 14 animals included  
445 in Experiment #3 to sequence a 268 bp long region of HIV *vif* (corresponding with codons  
446 23 to 112) using a sequencing approach comprising UMID and Illumina 150 bp pair-end  
447 sequencing technology analogous to the approach taken for analyzing *RT* sequence  
448 diversity. In total, we generated 579,466 high quality paired-end reads representing 6,983  
449 distinct UMIDs from 27 plasma vRNA samples.

450       We first looked for evidence of HIV-45G revertants at Day 30 and Day 58 post  
451 infection in five Vif-45G infected animals (**Fig. 6A**). Viruses in HIV-45G infected animals  
452 carrying the Vif-45E reversion were rare at Day 30 post infection (less than 1% in all five  
453 animals) but ranged between 0.5% and 9% of the plasma virus population present at Day  
454 58 post infection (**Fig. 6A**). These data suggest that the Vif-45G genotype is quite stable  
455 over time.

456       Since it has been suggested that *vif* diversification may be distinct from that of  
457 other HIV genes depending on the selective pressures exerted (7, 70, 77), we analyzed  
458 the nucleotide diversity, APOBEC3 driven mutagenesis and the rate of stop codons for the  
459 *vif* region sequenced (**Figs. 6B-6G**). The 268 bp long region of *vif* that we sequenced  
460 contains 17 or 18 GG (HIV-WT, Vif E45 = GAA; HIV-45G, Vif E45G = GGA) and 22 GA  
461 dinucleotides that could serve as APOBEC3 target motifs. Prior to treatment (Day 30 post  
462 infection), *vif* sequence diversity (**Fig. 6B**), GG-to-AG/GA-to-AA mutation rates (**Fig. 6C**)  
463 and stop codon frequency (**Fig. 6C**) were comparable between HIV-WT and HIV-45G  
464 infected mice. However, at Day 58 post infection, the Vif diversity was significantly higher  
465 in HIV-45G viruses compared to their wild-type counterparts ( $p=0.0357$ , **Fig. 6E**).  
466 APOBEC3 mutagenesis (GG-to-AG, GA-to-AA or rate of stop codon, **Figs. 6F-6G**) were  
467 comparable between the two groups.

468       Taken together, HIV-45G genotype can revert to wild-type Vif, but it only accounts  
469 for a small percentage of the circulating plasma variants in a portion of the mice tested.  
470 Moreover, there is some evidence suggesting that *RT* and *vif* regions diversity is caused  
471 by different mechanisms.

472

473 **DISCUSSION**

474           Proviruses with footprints of past cytidine deamination are found in many, if not all,  
475 HIV infected patients (11, 17, 22, 60, 78-83). Nonetheless, it remains controversial to what  
476 extent APOBEC3-driven mutagenesis contributes to viral evolution and HIV/AIDS disease  
477 outcome *in vivo*. Some clinical studies find correlations between frequency of G-to-A  
478 mutations in proviruses and plasma viral loads (7, 82, 84), whereas others fail to find such  
479 associations (17, 83, 85). Controlled experiments in cell culture, however, provide strong  
480 experimental evidence in support of the notion that A3G-driven mutagenesis facilitates  
481 HIV diversification and promote escape from selection pressure (44, 69, 86). In the current  
482 study, we perform controlled, *in vivo* infection experiments to provide new insights into the  
483 dynamics of HIV diversification within the plasma compartment of humanized mice in the  
484 absence and presence of selection pressure. We show that suboptimal neutralization of  
485 A3G shapes the phenotype of circulating viruses and compromises 3TC treatment  
486 outcomes.

487           Previous studies in cell culture (20, 44, 87) and in humanized mice (33-37) have  
488 examined the role of APOBEC3 proteins in HIV replication and pathogenesis *in vivo* but  
489 our study dissects the impact of A3G-driven mutagenesis in the context of viral evolution  
490 by introducing selection in the form of antiretroviral treatment. Moreover, we focus on viral  
491 diversification within the plasma compartment, which reflects the actively replicating viral  
492 quasispecies in an immediate and dynamic manner. HIV-45G, which has suboptimal anti-  
493 A3G activity, is less fit than HIV-WT in treatment-naïve animals overtime (**Fig. 2A**)  
494 pointing to the slow accumulation of mutations. Conversely, HIV-45G responds less well  
495 to and rebounds more rapidly in the presence of 3TC treatment (**Figs. 2B-2D**). Thus,  
496 complete inactivation of A3G is dispensable for initiating a productive and robust infection  
497 of humanized mice and suboptimal A3G neutralization can be beneficial to HIV for  
498 overcoming evolutionary bottlenecks such as selection pressure by antiretroviral drugs. Of  
499 note, a limitation of our experimental system is that the hu-NSG mouse model system  
500 used in this study lacks robust immunologic pressures against HIV (i.e., CD4+/CD8+ T  
501 cell responses or antibodies (88)) and thus, does not recapitulate well the continued  
502 selection pressure exerted by the adaptive immune system.

503           Sequencing technologies have dramatically improved over the last decade  
504 allowing for high-resolution, accurate representation of viral quasispecies. We combined

505 UMIDs with Illumina pair-end sequencing to analyze >150,000 individual *RT* sequences  
506 sampling approximately 1,170 distinct viral genomes for each individual time point.  
507 Previous studies in humanized mice examined sequence diversity using bulk amplification  
508 followed by sequencing of individual clones (33-36) or by single-genome sequencing  
509 (SGS, (36)). The first of these methods fails to reliably distinguish between individual  
510 variants and may skew viral diversity measurements due to PCR errors or bias (61, 62).  
511 SGS is regarded as gold standard in the field since it analyses distinct genomes and  
512 provides information on large regions. However, the approach is very work intensive and  
513 costly, limiting the numbers of genomes that can be sampled (89-91). For example, one  
514 previous study used SGS to analyze a total of 265 genomes from eight mice (36). In our  
515 study, in contrast, we analyzed on average 1,400 *RT* sequences per infected animal  
516 providing us with solid data on minority viral populations. It has to be noted that even at  
517 our high sequencing depth, we only sample a limited portion of the viruses circulating in  
518 the plasma compartment (i.e., average plasma viremia at Day 30 post infection is 89,620  
519 copies/mL). Despite this limitation, our sequencing data revealed a number of previously  
520 overlooked facts regarding the dynamics of HIV evolution *in vivo*. First, we found that 3TC  
521 drug resistant viral variants were found, in a third of the animals, prior to 3TC treatment  
522 initiation (**Fig. 3B**). Pre-existing 3TC resistance was, however, not linked to more rapid  
523 treatment failure suggesting that these viruses may not be fully replication competent  
524 and/or that drug resistant variants arise *de novo* upon initiation of antiretroviral treatment.  
525 Second, we noted a positive correlation between increased *RT* sequence diversity and  
526 high plasma viremia in HIV-45G infected animals after 30 days of unchecked replication  
527 (**Fig. 4B**). This association is surprising since conventional wisdom would predict the  
528 opposite to be true. Indeed, this is exactly what we observe for HIV-WT infections where  
529 increased *RT* diversity is associated with lower plasma viremia (**Fig. 4C**). Third, the  
530 kinetics with which the two drug resistant variants RT-184I and RT-184V appeared in the  
531 plasma differed between the two viruses. In mice infected with HIV-45G, the RT-184I  
532 variants arose at a rate 8.3-times faster than that of RT-184V variants, whereas  
533 emergence rates for these variants were comparable in mice infected with HIV-WT (**Fig.**  
534 **3D**). However, RT-184I did not appear more readily in HIV-45G infected animals. This  
535 could be due to the fact that our earliest collection time point was ten days after treatment  
536 initiation. It is also conceivable that drug resistant variants first evolve, replicate and

537 expand in tissue compartments with the plasma compartment being a mere reflection after  
538 the fact.

539       Taken together, future studies investigating the viral diversification at the viral  
540 RNA, cellular viral RNA and proviral level in vivo in the humanized model will provide  
541 further insights into how viral quasispecies shaped by APOBEC3 mutagenesis inform on  
542 HIV pathogenesis.

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550

551

552 **FIGURE LEGENDS**

553

554 **Fig. 1:** Infection of humanized mice with HIV-Vif variants.

555 (A) Newborn NOD-scid IL-2R $\gamma$ -null (NSG) mice were irradiated after birth and  
556 transplanted with human donor cord blood-derived CD34+ cells. Mice were infected  
557 intraperitoneally with  $2 \times 10^5$  TCID<sub>50</sub> of virus (HIV-WT, HIV-45G or HIV- $\Delta$ SLQ). The  
558 specifics for each of the three infection experiments are provided in the time-lines. Plasma  
559 was collected at the indicated time points for viremia measurements and sequence  
560 analysis.

561 (B) Comparison of the plasma viremia Day 30 post infection (baseline) in mice infected  
562 with the different viruses in the three different experiments. The lower limit of detection of  
563 the assay is 400 copies/mL (cp/mL). The mean and standard deviations of the viral loads  
564 are depicted. Viremia for HIV- $\Delta$ SLQ is significantly different from HIV-WT or HIV-45G ( $p$   
565  $\leq 0.0020$ , Mann-Whitney).

566

567



568 **Fig 2:** Viral replication in humanized mice in the absence or presence of 3TC treatment.

569 (A) Spaghetti plots depicting the change in viremia relative to baseline viral load (Day 30  
570 post infection) of individual untreated mice (pale lines) and mean change in viremia in  
571 untreated mice (bold lines).

572 (B) Barplots depicting the change in viremia at the end of infection (last available  
573 timepoint) versus baseline viremia in untreated mice. Means and standard deviation are  
574 depicted.  $p = 0.0026$  by unpaired student's t-test.

575 (C) Spaghetti plots depicting the change in viremia in 3TC treated mice.

576 (D) Barplots depict the overall change in viremia at the end of infection in 3TC treated  
577 mice with means and standard deviations.  $p = 0.0045$  by unpaired student's t-test.

578 (E) Rebound viremia – defined as the maximum fold rebound viral load from nadir  
579 (maximum level of suppression observed;  $\log(VL_{\max}/VL_{\text{nadir}})$  – is depicted for mice treated  
580 with 3TC. Each point represents an individual mouse. Mean and standard deviations are  
581 depicted.  $p = 0.0068$  by Mann-Whitney test.

582 (F) Rate of rebound was also measured over the time from nadir to maximum viremia.  
583 Means and standard deviations depicted.  $p = 0.0052$  by unpaired student's t-test.

584 (G) Qualitative assessment of treatment outcomes. 3TC treatment was defined as  
585 successful if the viral rebound was less than  $0.5 \log_{10}$  from nadir. Conversely, treatment  
586 failure was met if the viral rebound was greater than  $0.5 \log_{10}$  from nadir.  $p = 0.0237$ ,  
587 Fisher's exact test.

588

589

590 **Fig. 3:** Drug resistance development in 3TC treated mice.

591 (A) Genotypic 3TC drug resistance is due to single point mutations in codon 184 of HIV  
592 reverse transcriptase (*RT*) gene. Methionine (M184) represents the susceptible wild-type  
593 sequence while RT-184I or RT-184V render the virus resistant to 3TC.

594 (B) Pre-existing 3TC resistance detected at Day 30 post infection ("D30") prior to 3TC  
595 treatment initiation. Each dot represents the percentage of viruses encoding RT-184I or  
596 RT-184V in a given mouse. Minority 3TC resistant viral populations were defined as  
597 representing at least 1% of the total number of UMIDs sequenced for each mouse at this  
598 time point (dotted line). Some mice harbored both M184I/V variants and are indicated by  
599 mouse ID number. (\*)  $p \leq 0.05$ , Wilcoxon matched pairs signed rank test.

600 (C) Spaghetti plots longitudinally depicting the relative proportion of 3TC susceptible and  
601 resistant viral variants in HIV-WT infected mice. M184, RT-184I and RT-184V data for  
602 individual mice (pale lines) and mean proportions at each timepoint (bold lines) are  
603 depicted. Slopes of lines of best fit were calculated to measure kinetics of RT-184M, RT-  
604 184I and RT-184V variants. Slopes compared by F-test (ns: not significant,  $p = 0.5372$ ).

605 (D) Spaghetti plots longitudinally depicting the relative proportion of 3TC susceptible and  
606 resistant viral variants in HIV-45G infected mice. Slopes compared by F-test ( $p = 0.0035$ ).

607

608

609 **Fig. 4:** Genetic diversity of circulating viruses in the plasma of infected mice.

610 (A) Dot plot depicting nucleotide diversity ( $\pi$ ) in the sequenced HIV *RT* gene in HIV-WT  
611 and HIV-45G infected mice prior to initiation of 3TC treatment (30 Days post infection).  
612 Points represent  $\pi$  in each mouse and bars depict means.

613 (B) Diversity and viremia (VL) data in mice infected with HIV-WT prior to treatment were fit  
614 to a weighted nonlinear exponential growth (Malthusian) model. Best fit curve and 95%  
615 confidence interval (CI) bands are portrayed. The corresponding curve equation and  
616 weighted correlation coefficient (R) are depicted above.

617 (C) Diversity and VL data in mice infected with HIV-45G prior to treatment fit to an  
618 exponential growth model as in (B).

619 (D) Diversity in plasma viruses of HIV-WT infected mice over time (untreated left, 3TC  
620 treated right). Significance determined by Mann-Whitney test (\*,  $p \leq 0.05$ ; \*\*,  $p \leq 0.01$ ; \*\*\*,  
621  $p \leq 0.001$ ; \*\*\*\*,  $p \leq 0.0001$ ).

622 (E) Diversity in plasma viruses of HIV-45G infected mice over time (untreated left, 3TC  
623 treated right). Significance determined by Mann-Whitney test (\*,  $p \leq 0.05$ ; \*\*,  $p \leq 0.01$ ; \*\*\*,  
624  $p \leq 0.001$ ; \*\*\*\*,  $p \leq 0.0001$ ).

625

626

627 **Fig. 5:** Mutagenesis in HIV *RT* gene in plasma viruses of HIV infected mice.

628 (A) Dot plots depicting fractions of GG and GA dinucleotides mutated to AG (GG-to-AG)

629 and AA (GA-to-AA), respectively, in individual mice (points) prior to 3TC treatment (Day

630 30 post infection). Bars depict means.  $p = 0.0020$ , Wilcoxon matched pairs signed rank

631 test.

632 (B) Stop codons were quantitated across all plasma sequences and a stop codon rate for

633 every 1,000 codons sequenced was calculated for infected mice at Day 30 post infection.

634 (C) Fraction of GG-to-AG or GA-to-AA dinucleotides mutations in plasma samples at Day

635 58 post infection in 3TC treated mice. (\*)  $p \leq 0.05$ , (\*\*)  $p \leq 0.01$ , Wilcoxon matched pairs

636 signed rank test.

637 (D) Stop codon rate in plasma samples from Day 58 post infection.

638

639

640 **Fig. 6:** Characterizing HIV *Vif* mutations in infected mice.

641 (A) Genotype of *Vif* codon 45 in five mice infected with HIV-45G and treated with 3TC  
642 from 30 to 58 Days post infection. Percentage of 45G and revertant E45 sequences  
643 indicated on stacked barplots. Percentages of the latter are annotated, as well.

644 (B) Dot plots depicting nucleotide diversity ( $\pi$ ) in *Vif* sequences in individual mice (points)  
645 infected with HIV-WT or HIV-45G at 30 Days post infection (prior to 3TC treatment). Bars  
646 depict means.

647 (C) Dot plots depicting fractions of GG and GA dinucleotides mutated to AG (GG-to-AG)  
648 and AA (GA-to-AA), respectively, in individual mice (points) at 30 Days post infection.  
649 Bars depict means.

650 (D) Stop codon rates were quantitated across plasma *Vif* sequences at Day 30 post  
651 infection (as in Fig. 5B).

652 (E) Dot plots depicting  $\pi$  in *Vif* sequences in individual mice (points) at Day 58 post  
653 infection in 3TC treated mice.  $p = 0.0357$ , Mann-Whitney test.

654 (F) Fraction of GG-to-AG or GA-to-AA dinucleotides mutated in *Vif* at Day 58 post  
655 infection in 3TC treated mice.

656 (G) Stop codon rate in *Vif* sequences determined at Day 58 post infection in 3TC treated  
657 mice.

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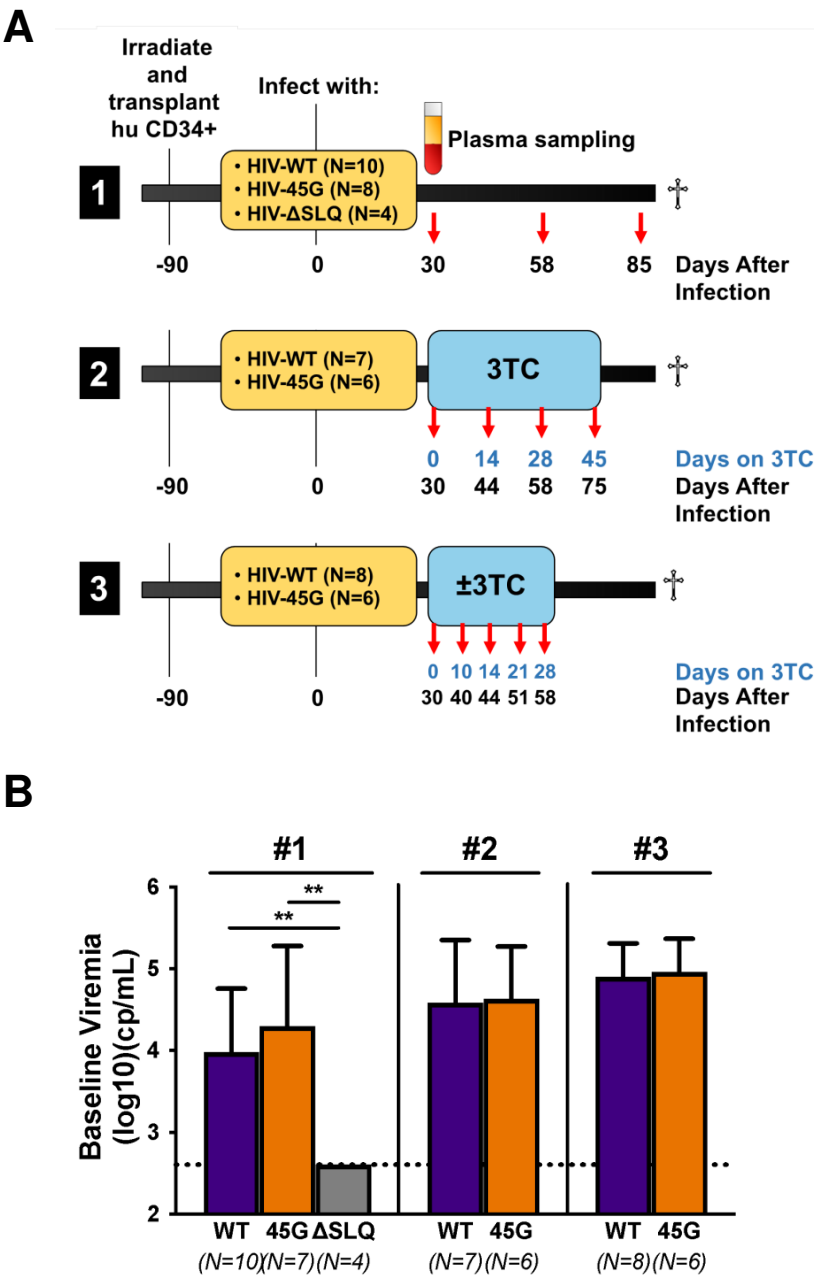
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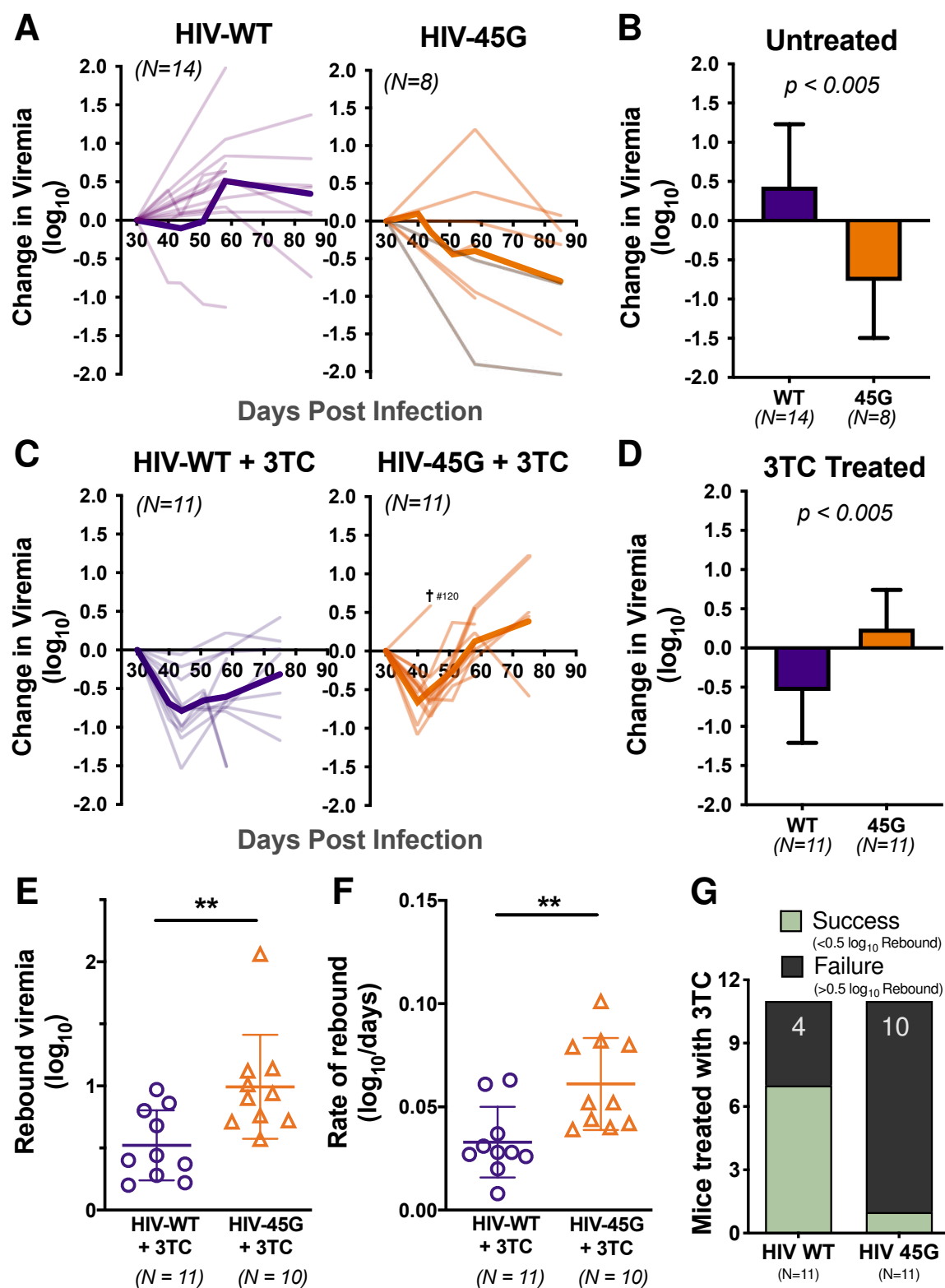
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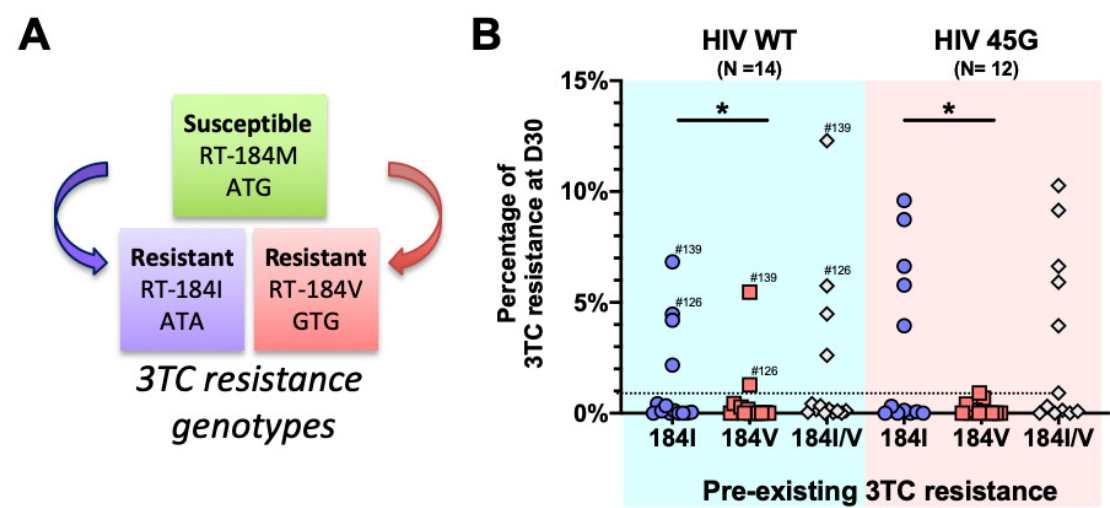


Hernandez et al., Figure 2

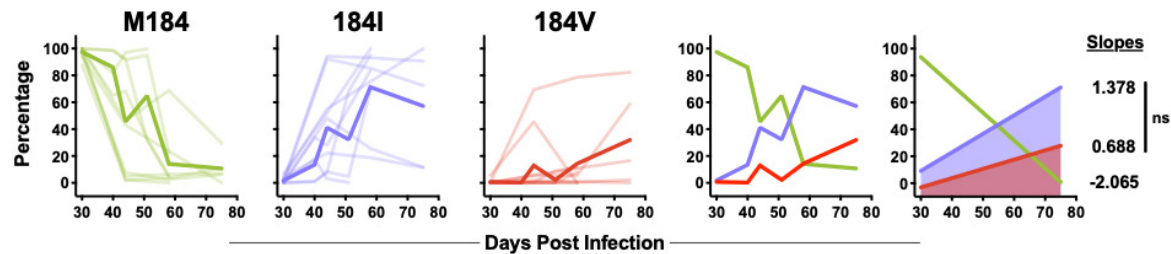




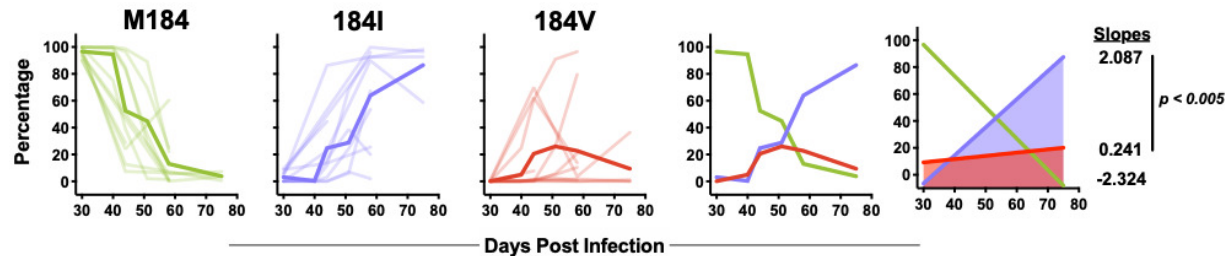
Hernandez et al., Figure 3



**C** Mice infected with HIV WT and treated with 3TC

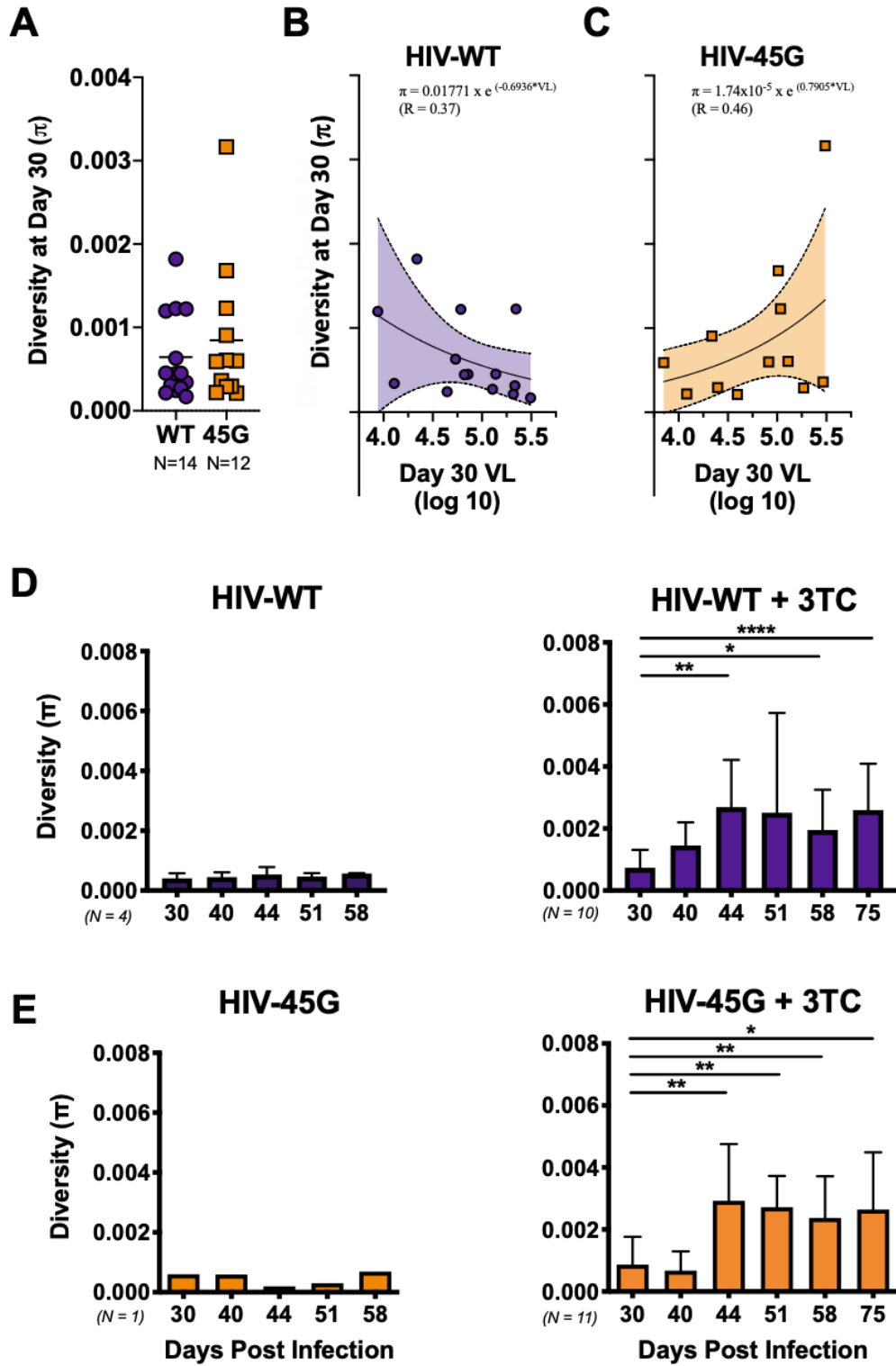


**D** Mice infected with HIV 45G and treated with 3TC

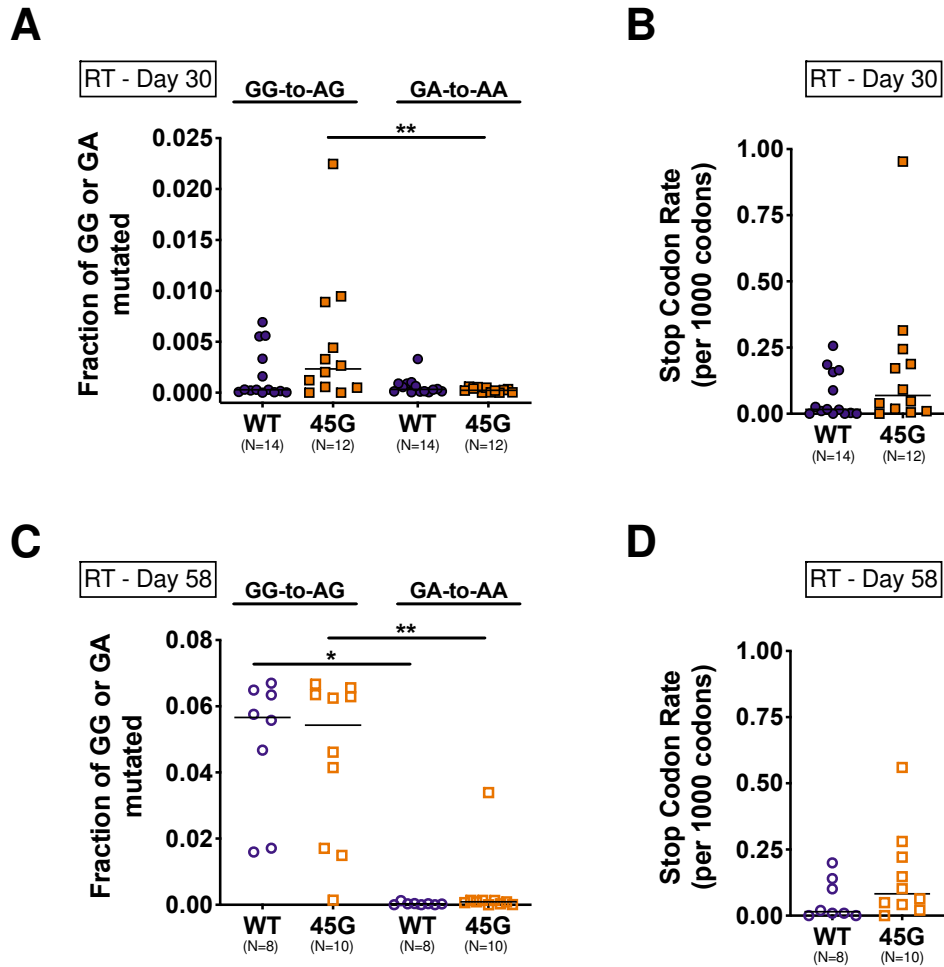




Hernandez et al., Figure 4



Hernandez et al., Figure 5



Hernandez et al., Figure 6

